# Alternative Bioassays of Kinship between Loci

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# **Summary**

In this study four asymptotically equivalent estimates of kinship are derived, in the general case and for kinship between multiallelic loci. Two estimates based on  $\chi^2$  agree closely, with the Shannon estimate giving the smaller variance. The PAH, GM, and HBB systems conform to a recombinational model with an evolutionary size of ~4,000 and a ratio of recombination to physical distance of ~1.4  $\times$  10<sup>-5</sup> morgans/kb, as predicted on the basis of the genetic and physical lengths of the human genome. The INS and D11S12 systems have a much more rapid decline of kinship with physical distance, suggesting overlapping RFLPs (unrecognized allelism), recombinational hot spots, or selection. Sources of error in predicting kinship over small distances are discussed.

### Introduction

Genetic relationship between individuals, populations, and loci is measured by kinship, which may be predicted on the basis of genealogy or migration and bioassayed on the basis of gene frequencies, discrete phenotypes, quantitative traits, clans, or surnames (Morton et al. 1971). Here we are concerned with alternative bioassays based on gene frequencies and with their validation vis-à-vis a known population structure that specifies isolation by distance, a cladogram of diverging populations, or (in this paper) a linear order of linked genes. The question to be answered is which formulation permits inference of the known structure with minimal error. Similarity metrics that do not estimate kinship have no simple genetic interpretation and will not be considered.

# **Theory**

Let  $Q_k$  be the kth gene frequency in an array of populations, and let  $q_{ki}$  be the corresponding frequency in the ith population (k = 1, ..., K; i = 1, ..., I). Then the expected homozygosity in a cross

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between populations i and j with kinship  $\varphi_{ij}$  is  $E(q_{ki}q_{kj}) = Q_k^2 + \varphi_{ij}Q_k(1 - Q_k)$ . After summing and rearranging, the homozygosity estimate of kinship is

$$\varphi_{ij}(\mathbf{H}) = \frac{\sum_{k} q_{ki}q_{kj} - \Sigma Q_k^2}{1 - \Sigma Q_k^2}.$$

Weighting each element in the original equation by  $1/Q_k$  before summing and rearranging yields the  $\chi^2$  estimate of kinship

$$\varphi_{ij}(C) = \frac{\sum (q_{ki}q_{kj}/Q_k) - 1}{K - 1}.$$

For a codominant system this is proportional to Pearsonian  $\chi^2$  with observed frequency  $\sqrt{q_{ki}q_{kj}}$  and expectation  $Q_k$ . The corresponding Shannon estimate of kinship based on the  $\chi^2$  likelihood ratio is

$$\varphi_{ij}(S) = \frac{2\sum_{k} \sqrt{q_{ki}q_{kj}} \ln (\sqrt{q_{ki}q_{kj}}/Q_k)}{K-1},$$

evaluated under the convention that  $0 \ln 0 = 0$ . These estimates are unbiased for  $i \neq j$ . If codominant gene frequencies in the *i*th population are based on a disomic locus in a sample of  $N_i$  individuals, an unbiased estimate of kinship in the population is

$$\varphi_{ii} = \frac{\varphi_{ij} - 1/2N_i}{1 - 1/2N_i},$$

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where  $\varphi_{ij}$  as an estimate of kinship in the sample is given by the above equations for i = j.

These formulas do not exhaust kinship estimates. A less direct approach begins with gene frequency deviations,  $\Delta_{ki} = q_{ki} - Q_k$ , and uses the Wahlund (W) principle to write the covariance  $\Delta_{ki}\Delta_{kj} = Q_k(1 - Q_k)\varphi_{kii}$ . Then mean kinship is

$$\varphi_{ij} = \sum_{k} w_{k^{\varphi}kij}/\sum w_{k},$$

where  $w_k > 0$  is a weight. If we take  $w_k = 1 - Q_k$ , we obtain the  $\chi^2$  and Shannon estimates. However, taking  $w_k = Q_k(1 - Q_k)$  gives the Wahlund estimate of kinship,

$$\varphi_{ij}(\mathbf{W}) = \frac{\sum_{k} (q_{ki} - Q_k)(q_{kj} - Q_k)}{1 - \sum_{k} Q_k^2}.$$

This has the same expectation as the homozygosity estimate but in practice is different, being always positive for i = j. Of course, small values can become negative after correction for sample size. If gene frequencies are replaced by surnames so that homozygosity becomes isonymy, the above equations remain valid except that  $\varphi$  must be divided by 4.

Similar formulas apply to kinship between loci (Morton and Simpson 1983). Then  $q_{rs}$  is the hap-

lotype frequency for allele s at locus i and allele r at locus j, and  $Q_{rs} = q_r q_s$  is the expected haplotype frequency under linkage equilibrium. If  $r = 1, \ldots, R$  and  $s = 1, \ldots, S$ , the number of df (replacing K - 1) is (R - 1)(S - 1). Formulas for  $\varphi_{ij}$  are given in table 1. If both loci are diallelic,  $\varphi_{ij}$  reduces to  $\rho^2$ , where  $\rho$  is both the standardized disequilibrium statistic and the correlation between loci (Hill and Robertson 1968). The  $\chi^2$  estimate has been used for pairs of diallelic loci by Chakravarti et al. (1984b). This is generalized to any number of alleles in table 1, where  $\varphi_{ij}$  is the mean value of  $\rho^2$ .

Sometimes a particular allele is selected at one locus. Let  $q_s$  be the conditional frequency of allele s at the other locus, and let  $Q_s > 0$  be the corresponding marginal frequency in the population. This special case is also given in table 1.

Since kinship between loci is asymptotically a quadratic form, it has bias 1/n if based on a count of n haplotypes (Weir and Hill 1986). After being denoted with a prime symbol, the formulas in table 1 are transformed to

$$\varphi_{ij}=\frac{\varphi'_{ij}-1/n}{1-1/n}.$$

If the physical distance between two loci is k kilobases and if the ratio of the recombination frequency

Table I

Kinship between Loci

	$\Phi_{ij}$					
Estimate	General	Selected Allele				
(H)	$\sum_{r} \sum_{s} q_{rs}^2 - \sum_{r} q_r^2 \sum_{s} q_s^2$	$\sum_{s} q_s^2 - \sum_{s} Q_s^2$				
,	$1 - \sum_{r} q_r^2 \sum_{s} q_s^2$	$1-\sum_s Q_s^2$				
(C)	$\sum_{r}\sum_{s}(q_{rs}^{2}/q_{r}q_{s})-1$ $(R-1)(S-1)$	$\frac{\sum_{s} (q_s^2/Q_s) - 1}{S - 1}$				
(S)	$2\sum_{r}\sum_{s}q_{rs}\ln(q_{rs}/q_{r}q_{s})$ $(R-1)(S-1)$	$\frac{2\sum_{s}q_{s}\ln\left(q_{s}/Q_{s}\right)}{S-1}$				
( <b>W</b> )	$\frac{\sum_{r}\sum_{s}(q_{rs}-q_{r}q_{s})^{2}}{1-\sum_{s}q_{r}^{2}\sum_{s}q_{s}^{2}}$	$\frac{\sum_{s} (q_s - Q_s)^2}{1 - \sum_{s} Q_s^2}$				

( $\theta$ ) to physical distance is  $R = \theta/k$ , the expected kinship between loci at equilibrium between drift and recombination is

$$\varphi = \frac{1}{4N_e\theta + 1} = \frac{1}{4N_eRk + 1},$$

where  $N_e$  is the evolutionary size of the population. Since  $N_e$  and R are unknown and R varies among systems, we set  $4N_eR = C$  as the parameter to be estimated. On the basis of the noncentral  $\chi^2$  distribution, the information about  $\varphi$  is taken to be W = (n-1)(1+Ck)/(Ck+2n-1). To estimate C we minimize the function  $f = \sum W[\varphi - 1/(1+Ck)]^2/2$  for m estimates of kinship and stable weights W, with  $\varphi$  constrained to the 0,1 interval. This gives the Newton-Raphson iteration in which weights stabilize as C converges:  $C = C_0 + U/K \rightarrow \hat{C} > 0$ , where  $U = -\sum Wk[\varphi - 1/(1+Ck)]/(1+Ck)^2$ ;  $K = \sum Wk^2/(1+Ck)^4$ ; and the SE of  $\hat{C}$  is  $\sqrt{2f/(m-1)K}$ . These calculations are performed by the computer program HAPLOKIN (Appendix).

### **Results**

Morton and Simpson (1983), Chakravarti et al. (1984a, 1984b), and Morton and Lew (1985) developed methods to map closely linked loci on the basis of haplotype frequencies and concluded that kinship between loci is the appropriate statistic. We have applied our formulas to these and other data sets (table 2).

Homozygosity kinship consistently exceeds the  $\chi^2$  and Shannon estimates. We do not understand this systematic difference between asymptotically equivalent methods. The variance of homozygosity kinship

is notably high. As remarked by Morton et al. (1971), homozygosity is dominated by large gene frequencies, which are reciprocally weighted in efficient estimates. Therefore we shall not consider the homozygosity estimate further.

The Wahlund estimate is comparable to the homozygosity estimate and less reliable than the two estimates based on  $\chi^2$ . This is to be expected, since the Wahlund weights discriminate against rare genes. Even for equal gene frequencies, extreme linkage disequilibrium leads to great discrepancy between the homozygosity and Wahlund estimates, on the one hand, and the  $\chi^2$  or Shannon estimates on the other. For example, if  $q_{11} = q_{22} = .5$  and  $q_{12} = q_{21} = 0$ , then in large samples  $\varphi(H) = \varphi(W) = \frac{1}{3}$ ,  $\varphi(C) = 1$ , and  $\varphi(S) = 2\ln 2$ , which is censored to 1.

Shannon and  $\chi^2$  kinship agree extremely well, reflecting the convergence of Pearsonian and likelihood ratio  $\chi^2$  in large samples. The variances are acceptably small, with a tendency for the Shannon estimate to have a smaller variance. This agrees with the generally better performance of likelihood ratio  $\chi^2$  in small samples (Fisher 1922).

#### **Discussion**

A remarkable feature of the data is that systems highly polymorphic over sequences <30 kb show rapid decline of kinship with distance. There are problems in studying kinship over distances not much greater than the RFLPs themselves. Length polymorphism may induce substantial relative error in nominal distance, and the RFLPs may overlap (unrecognized allelism). If some haplotypes are missing in a large sample, is this due to linkage disequilibrium or allelism? In the latter event, the "loci" should be

Table 2

Ĉ ± SE for Four Kinship Bioassays

System (Source*) PAH (1)	Maximum k	$\hat{C} \pm SE$								
		φ(	H)	φ(	W)	φ(	(C)	φ	(S)	$V_c/V_s$
		.786	.200	1.379	.313	.240	.056	.219	.052	1.15
INS (2)		32.756	19.098	92.321	19.538	4.662	2.654	4.185	1.760	2.27
GH (3)		.830	.682	.813	.434	.114	.062	.088	.045	1.93
D11S12 (4)	6.9	31.319	78.420	138.564	359.702	6.137	9.951	6.878	9.888	1.01
GM (5)	136.0	.268	.081	.550	.228	.194	.077	.158	.068	1.27
HBB (6)		1.369	.798	1.245	.627	.240	.118	.182	.085	1.94

<sup>&</sup>lt;sup>a</sup> 1, Chakraborty et al. 1987; 2, Chakravarti et al. 1986; 3, Chakravarti et al. 1984*b*; 4, Barker et al. 1984; 5, Migone et al. 1985; and 6, Pagnier et al. 1984.

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pooled. Since allelic correlations are negative, the effect of such pooling is to raise the estimate of kinship and therefore lower the estimate of C; for example, the closely linked RsaI and TaqI sites in INS showed no - haplotype in 35 U.S. blacks and 86 Caucasians and Pima Indians, suggesting that they form an allelic series over a 2-kb region. Treating them as such reduces the estimate of C from 4.7 to 3.0 for  $\chi^2$  kinship and from 3.1 to 2.9 for Shannon kinship.

Chiasma frequencies suggest that the  $3 \times 10^6$  kb of the haploid genome have a genetic length of 30 morgans in males. If the X chromosome and the greater  $\theta$  in females are taken into account, this implies that R for the whole genome is  $\sim 1.4 \times 10^{-5}$ morgans/kb. N<sub>e</sub> in human populations of diverse origin is thought to be ~4,000, on the basis of weak evidence. These values are consistent with  $C = 4N_eR$ = .224. It is not plausible that  $N_e$  should vary among systems within a population. Therefore much larger values of C, as observed for INS and D11S12, suggest either failure of the model (e.g., maintenance of polymorphism by selection) or a locally elevated value of R. For the HBB system, a recombinational hot spot has been inferred in the 9.1-kb region 5' to the normal β gene (Chakravarti et al. 1984a). This is not apparent in those haplotypes carrying the sickle cell hemoglobin gene that are considered here, perhaps reflecting their short evolutionary history.

Our goal in this study was not to describe or interpret variation in estimates of C but to compare alternative kinship bioassays. It is clear that the homozygosity approach is inferior to the two  $\chi^2$ -based metrics, of which the Shannon estimate has smaller variance in this material. We therefore advocate this metric for determining kinship between either populations or loci whenever data are reduced to haplotype frequencies. Conventional kinship bioassay remains preferable when (1) data are reported as phenotype frequencies for factor-union systems, (2) there may be dominance, (3) the information matrix is of manageable size, and (4) the object is to estimate kinship between populations (Morton 1975).

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# **Appendix**

#### HAPLOKIN

This procedure estimates kinship between loci on the basis of haplotype frequencies.

# I. Assignment

Data, job, summary, and prolix files are required. A control-point (CP) file is optional.

# II. Input

The job file has a major control—HK (A,1) (B,3) (C,2) (N,4,n)—specifying numeric fields for as many as 12 loci and for the haplotype count N, where n is the sample size. Blanks are read as zero. FM, ED, and CC controls are required. An ED control specifies allele codes for a particular locus, e.g., ED (A,1,2). Alleles not specified are pooled into a class designated 0. An optional MC control gives physical coordinates of loci, e.g., MC (0, 5.4, 23.1, 66.1, . . .), for which the distance between loci may be calculated as  $k_{ij} = |MC_i - MC_j|$ .

# III. Analysis

Four estimates of kinship between loci are calculated (table 1).  $C_0$  is assumed to be .25. If during iteration  $C \le 0$ , it is set to C/2. Only pairs of loci with specified physical distance are used to estimate C. Convergence is declared if  $U^2(m-1)/2fK < 10^{-10}$ .

# IV. Output

The summary file gives file assignments; allele frequencies for each locus; values of R, S, and K; and the four kinship estimates for each of the n(n-1)/2 pairs of n loci, where R and S are the numbers of nonzero allele frequencies at the two loci. In addition,  $\hat{C}$ , the variances, and the SEs are computed. The prolix file gives haplotype frequencies for each pair of loci and successive iterations for each estimate of C.

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